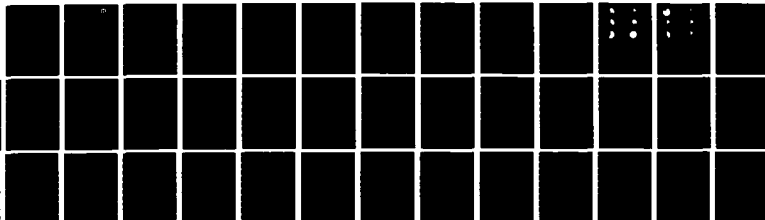


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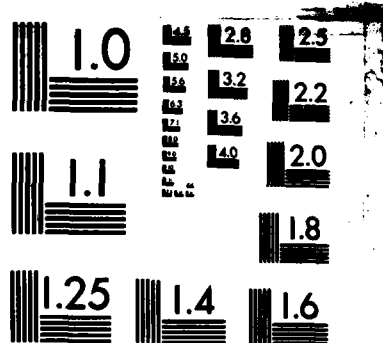
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# Special Report 85-7

May 1985



**US Army Corps  
of Engineers**

Cold Regions Research &  
Engineering Laboratory

## *An analysis of the Revere, Quincy and Stamford structure data bases for predicting building material distribution*

Carolyn J. Merry and Perry J. LaPotin

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20. Abstract (cont'd)

However, all indicators (including building type) explained only low percentages of the variability in the dependent variable (building surface area). Our results indicated that other variables are required to explain the variability of building surface area adequately.

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## PREFACE

This report was prepared by Carolyn J. Merry, Geologist, Earth Sciences Branch, Research Division, U.S. Army Cold Regions Research and Engineering Laboratory, and Perry J. LaPotin, Research Engineer, Thayer School of Engineering, Dartmouth College, Hanover, New Hampshire.

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**CONVERSION FACTORS: U.S. CUSTOMARY TO METRIC (SI) UNITS OF MEASUREMENT**

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<u>Multiply</u>	<u>By</u>	<u>To obtain</u>
foot	0.3048*	meter

\*Exact



# AN ANALYSIS OF THE REVERE, QUINCY AND STAMFORD STRUCTURE DATA BASES FOR PREDICTING BUILDING MATERIAL DISTRIBUTION

Carolyn J. Merry and Perry J. LaPotin

## INTRODUCTION

Our work on the acid rain program with the Environmental Protection Agency is in support of Task Group G, Effects on Building Materials and Cultural Resources. One objective is to examine the usefulness of information on land use and census tract for predicting the types and amounts of building materials exposed to acid deposition. To do this we are examining the data bases that the Corps of Engineers District Offices have on file for structures in the flood plains within their jurisdictional boundaries.

We recommended several structure data bases in New England for further study based on the number of land use categories, the types of building material, the structure dimension data, the number of total structures and whether the data base was computerized (Merry et al. 1985). Three New England data bases were selected for this study: Revere and Quincy, Massachusetts, and Stamford, Connecticut (Fig. 1).

The objective of this study was to use the Corps inventories of structures in Revere, Quincy and Stamford to see if land use, census tract and building type information could be used to predict the surface area of each building material type that is exposed. If there is a predictable relationship, a city could be stratified into sampling frames based on land use and census tract information (Rosenfield 1984), and area distributions of building material types could be predicted for other cities with similar demographics.

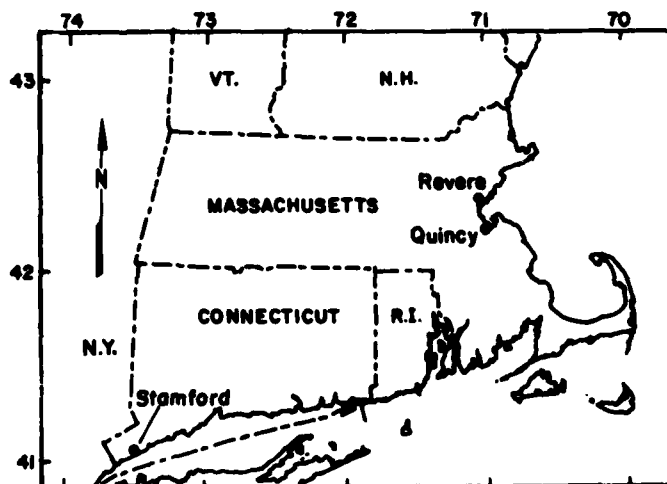


Figure 1. Locations of the three cities studied.

## DATA DESCRIPTION

The Corps of Engineers flood plain data for Revere, Quincy and Stamford comprised five major variables: structure dimension (height, length, width), structure type and structure material. Both census tract and land use information by location were added to the original Corps of Engineers data.

Dimension variables were calculated from the Corps data on structure length, width and number of stories. The height of each structure was estimated by multiplying the number of stories per structure by our estimate of the average height per story (12 ft).

Each structure was categorized according to the primary use of the building. The ranking from 1 to 3 was made according to the degree of urbanization:

<u>Code</u>	<u>Building type</u>
1	single-family residential
2	multi-family residential
3	commercial/industrial.

Building material types were coded from 1 to 8 according to the predominant material within a given structure. The categories were:

<u>Code</u>	<u>Predominant Material</u>
1	Wood
2	Brick
3	Stucco
4	Cement/concrete
5	Metal (ferrous, non-ferrous)
6	Shingles (asphalt)
7	Stone
8	Vinyl.

Land use data (1:250,000 scale) were based on the digital information from GIRAS (geographic information retrieval and analysis system) (Mitchell et al. 1977). The aerial photographs used in GIRAS are from 1972-1974 (Loelkes 1977). The following categories of land use were found in the Stamford, Quincy and Revere data bases:

<u>Code</u>	<u>Class</u>	<u>Description</u>
11	Residential	Single family dwellings, multiple-unit structures
12	Commercial and services	Stores, shopping centers
13	Industrial	Light to heavy manufacturing
17	Other urban or built-up land	Urban parks, cemeteries, undeveloped land within an urban setting
51	Streams and canals	Rivers, creeks and canals
62	Nonforested wetlands	Marshland, wet meadows and bogs.

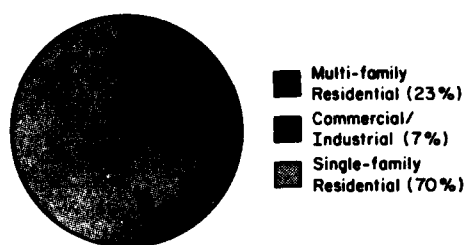
Additional description of the land cover classes can be found in Anderson et al. (1976).

The census tract numbers that were found in the data sets of Stamford, Quincy and Revere are:

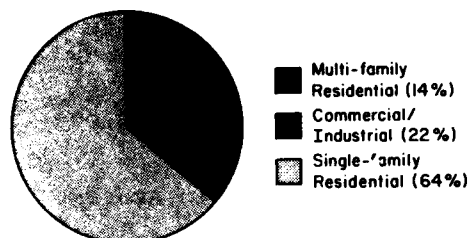
<u>Location</u>	<u>Census Tract</u>
Stamford	201, 213, 215, 216
Quincy	4177, 4179, 4180, 4191
Revere	1704, 1705, 1706.

Figure 2 shows the relative distribution of building types in Revere, Quincy and Stamford. The Stamford buildings are primarily multi-family residences (41%), followed by industrial/commercial structures (18%). Only 6% of the sampled Stamford buildings are single-family residences. A significant portion of the Stamford data (35%) was not classified by building type and therefore is shown by missing values. In both Quincy and Revere, single-family residences dominate the classification, representing, respectively, 64% and 70% of the sites examined. A smaller percentage of multi-family residential structures was found, with 14% observed in Quincy and 23% found in Revere. The Quincy site showed the largest proportion of commercial/industrial buildings (22%), followed by Stamford (18%) and Revere (7%).

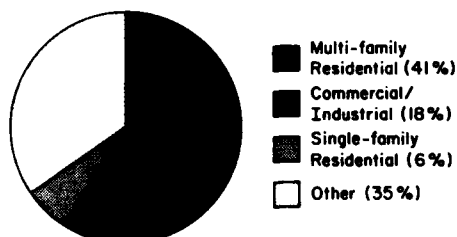
Figure 3 illustrates the relative proportion of land use within each city. Residential land use dominates in Stamford and Quincy (85% and 75%, respectively). Nonforested wetlands is the most prevalent category in Revere (59%). The commercial and services category is well represented in Stamford (11%) and Quincy (23%) but not in Revere (6%). This distribution



a. Revere.

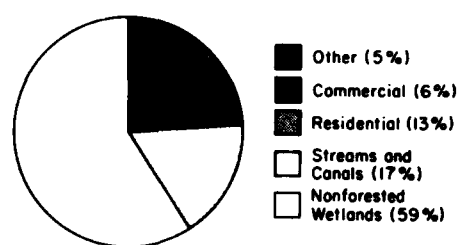


b. Quincy.

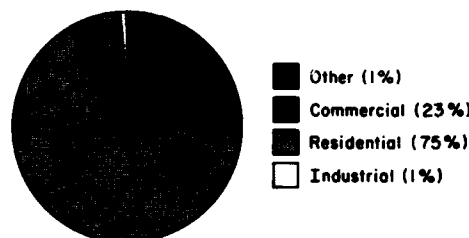


c. Stamford.

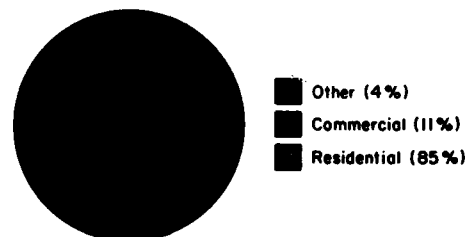
Figure 2. Frequency distribution of building type.



a. Revere.



b. Quincy.

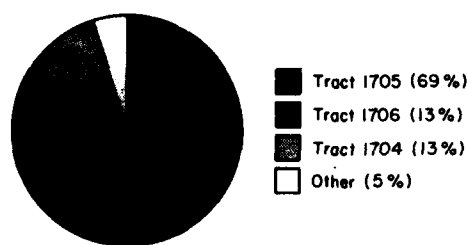


c. Stamford.

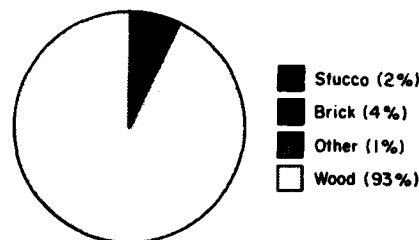
Figure 3. Frequency distribution of land use.

suggests that rural land groupings are less frequent in both Stamford and Quincy and more frequent in Revere. If streams, canals and nonforested wetlands are considered rural, less than 1% of the land in Stamford and Quincy is rural, while 76% of Revere is classified as rural. All three locations have a low percentage of industrial land use (less than 1%), the classification that traditionally has the largest building material exposure (EPA 1983).

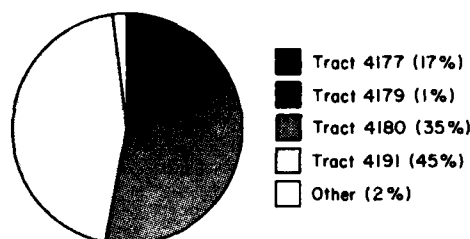
Figure 4 illustrates the distribution of buildings in each census tract. Most of the Revere buildings are within census tract 1705 (69%), with only 26% in the combined tracts of 1704 and 1706. In Quincy, 80% of the buildings are within census tracts 4191 (45%) and 4180 (35%). The Stamford data are split between three major census tracts.



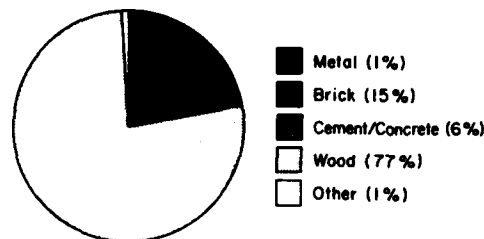
a. Revere.



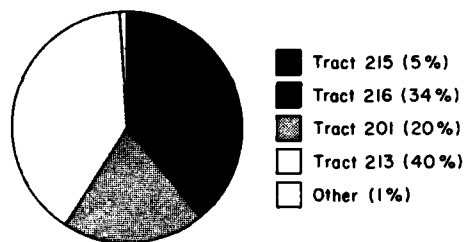
a. Revere.



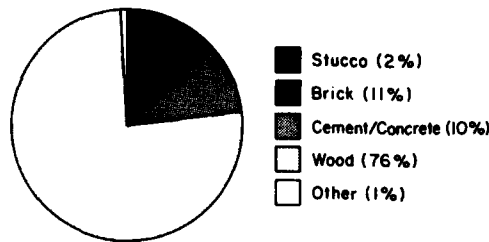
b. Quincy.



b. Quincy.



c. Stamford.



c. Stamford.

Figure 4. Frequency distribution of census tract.

Figure 5. Frequency distribution of building material type.

The Corps of Engineers classifies structures in the flood plain according to the predominant material in the total building. In this form of classification, predominant materials are over-represented (100%) and subordinate materials are under-represented (0%). The loss of information becomes significant when structures with roughly even proportions of material type become classified as a single material type (for example, a building made of 51% brick and 49% wood is classified as 100% brick and 0% wood). This condition will generally result in random errors, which simply increase uncertainty but do not bias statistical parameter estimates. The bias will be worse if one material type is frequently minor and rarely predominant.

It is not surprising, then, that one or two materials might dominate the entire classification of building material type. The distribution of material types is provided in Figure 5. In all three locations, wood construction dominates (Revere 93%, Quincy 77% and Stamford 76%). This class in-

cludes both painted and unpainted wood surfaces, as well as stained wood exteriors. In Revere, only 7% of the buildings (neglecting missing values) have non-wood surfaces. In Stamford, non-wood surfaces contributed less than one quarter of the sampling points. The Quincy distribution is principally wood (77%), followed by brick (15%) and cement/concrete (6%).

## DATA ANALYSIS

### Discrete variables

The Statistical Package for the Social Sciences (SPSS) software was used in our statistical analyses (Nie et al. 1975). We analyzed the three data bases on buildings in two ways. First, we divided the building surface area data into discrete variables by grouping the data points into five groups. By analyzing the data this way, chi-square, asymmetric lambda and the uncertainty coefficient could be obtained. The second part of our analysis treated the building surface area as a continuous variable, rather than a discrete variable. This was done in case we had made an incorrect assumption when dividing the building surface area into discrete variables.

We used contingency tables to determine how much the building surface area and the type of material depend on building type, census tract and land use (Appendix A). The building surface area, a continuous variable, was divided into five classifications, with each classification containing approximately 20% of the total data points for each city. The segmentation routine was

$$\text{if } P_i \leq P < P_{i+1} \text{ then } P_g = i+1$$

$$\text{where } P_g = \int_{P_i}^{P_{i+1}} f(p)dp = 0.20$$

$$i = 0, 1, 2, \dots, m$$

where  $i$  = group number index for building surface area  
 $m$  = number of groups (equal to 5 in our analysis)

Table 1. Statistical measures of chi-square, asymmetric lambda and the uncertainty coefficient of building surface area and building material with building type, building material, census tract and land use for Revere, Quincy and Stamford.

			Independent variables				
			Building type	Building material	Census tract	Land use	
<u>Dependent variables</u>	Building surface area	Significance of $\chi^2$	< 0.0001	< 0.0001	0.0003	< 0.0001	Revere
			< 0.0001	< 0.0001	< 0.0001	< 0.0001	Quincy
			< 0.0001	< 0.0001	< 0.0001	0.0001	Stamford
	$\lambda$ (asymmetric)		0.19368	0.04560	0.00760	0.03800	Revere
			0.15745	0.13191	0.20435	0.12446	Quincy
			0.18675	0.19844	0.12941	0.03704	Stamford
	Uncertainty coefficient (asymmetric)		0.14603	0.03329	0.00799	0.01386	Revere
			0.11867	0.08217	0.17909	0.09518	Quincy
			0.09648	0.12664	0.08363	0.02209	Stamford
	Building material	Significance of $\chi^2$	< 0.0001		0.0095	0.0329	Revere
			< 0.0001		< 0.0001	< 0.0001	Quincy
			< 0.0001		< 0.0001	< 0.0001	Stamford
	$\lambda$ (asymmetric)		0.00000		0.00000	0.00000	Revere
			0.43478		0.04688	0.00000	Quincy
			0.34884		0.02326	0.00000	Stamford
	Uncertainty coefficient (asymmetric)		0.10387		0.05716	0.05338	Revere
			0.50547		0.26643	0.15918	Quincy
			0.33845		0.22137	0.08327	Stamford

$P_i$  = index on the building surface area distribution

$P_g$  = building surface area group

$f(p)$  = distribution of building surface areas by location

$P$  = exposed building surface area.

The new variable,  $P_g$ , contains 20% of the data points from the distribution of building surface area,  $P$ .

A matrix of association between the dependent variables (building surface area and building material) and the independent classification variables (building type, census tract and land use) is presented in Table 1. Cross-tabulations for each pair summarized in Table 1 are provided in Appendix A. Building material is included as both an independent and a dependent variable. This was done to examine the level of association between building surface area and material type (for example, if the building material is known, how much information about the building surface area

follows). Each cell in the matrix has three values corresponding to the sampling location.

Two measures of explaining power, the asymmetric lambda ( $\lambda$ ) coefficient and the uncertainty coefficient (asymmetric), were computed. The asymmetric lambda statistic measures the improvement in predictive power as a result of the additional information obtained by the independent variable. "The maximum value of lambda is 1.0, which occurs when a prediction can be made without error, i.e., when each independent variable category can be associated with a single category on the dependent variable. A value of zero means no improvement in prediction" (Nie et al. 1975, p. 225). As an example of its use, consider the lambda value of 0.19 for building type and building surface area for the Revere data (Table 1). This value suggests that knowing the building type (for example, single-family residence) increases one's ability to predict the value of building surface area by 19%.

The uncertainty coefficient is a measure of uncertainty reduction in the dependent variable as a result of knowledge about the behavior of the independent variable. "The maximum value for the uncertainty coefficient is 1.0, which denotes the complete elimination of uncertainty. As with lambda, this is achieved only when each category of the independent variable is associated with a single category on the dependent variable. When no improvement occurs, the uncertainty coefficient takes on the value of zero" (Nie et al. 1975, pp. 226-227). For the example of building surface area and building type in Revere, the uncertainty coefficient was 0.15. This value suggests that one is 15% more certain of the behavior of building surface area as a result of knowing the building type.

The chi-square statistic was computed for each dependent-independent variable pair. The significance level in the chi-square test may be interpreted as the probability of getting a chi-square ordinate of the value observed (or one greater) given the null hypothesis (i.e. that statistical independence is true). Thus, small probabilities suggest a small likelihood of independence and larger probabilities (0.10 and above) imply a strong potential for statistical association. This statistic is used to determine whether or not there is a systematic relationship between two variables (the test of statistical independence). The chi-square values for the relationships between building surface area and each classification variable (building type, building material, census tract and land use) are significant at the 0.0001 level or below except for the value for building surface area and



census tract for Revere, which was significant to the 0.0003 level. In each case, we can suggest a rejection of the null hypothesis that the variables are statistically independent (Walpole and Myers 1978). This does not imply a cause-and-effect relationship between the variables; it simply implies that there is a systematic relationship between building surface area and building type, building material, census tract and land use.

The asymmetric lambda and the uncertainty coefficient provide associated measures of explaining power between the variables listed in the matrix. These measures improve on the chi-square statistic by providing indicators of dependency, not just addressing the question of statistical independence.

For the Revere, Quincy and Stamford data bases, each of the variables is a fairly poor predictor of the building surface area and the building material type. The highest asymmetric lambda value is approximately 0.19 for predicting the building surface area knowing building type. Values are lower, however, for the corresponding uncertainty coefficients. For Stamford, information on building type improves our understanding of the building surface area distribution only slightly, with an uncertainty coefficient of 0.10. For Quincy and Stamford the building type is the strongest predictor of building material type, with uncertainty coefficients of 0.50 and 0.34, but the relationship does not hold for Revere, with an uncertainty coefficient of 0.10.

It has been postulated that building materials provide information about the size of the structure and thus the building surface area (EPA 1983). For example, reinforced concrete is normally found in larger buildings requiring additional structural integrity. However, for the three sites we considered, knowledge of the material type improves our prediction of building surface area only slightly. This follows from the lack of diversity of materials at each location (Fig. 5) and perhaps from the method with which structures were classified (i.e. according to the predominant material only).

Classification of building surface areas and material types by census tract produced significant chi-square ordinates. In all cases the independence of building surface area and building material with census tract was rejected at the 0.01 level and below. The lambda and uncertainty coefficients for Revere show that census tract is not helpful in predicting building surface area and building material. The uncertainty coefficient shows that knowing the census tract provides only a 0.8% decline in uncertainty about building surface area and material type.

In Quincy, knowledge of the census tract reduces the uncertainty of building material distribution by 27%. The lambda values suggest that the power of census tract for predicting building material type is close to 5%. An 18% reduction in uncertainty of building surface area distribution results from knowledge of census tract. In addition the census variable provides 20% of the information about building surface area.

For Stamford, census tract information produced a 13% improvement in predicting building surface area. The use of census tract as an indicator for building material type is far less significant, yielding a 2% rise in explaining power. The corresponding loss of uncertainty was significant at 22%.

The final variable considered in Table 1 is land use. The chi-square values show that a relationship exists between land use and building surface area. Lambda values for Revere show that land use outperforms census tract as a predictor of building surface area. In Quincy and Stamford, census tract is a much better predictor of building surface area. In Quincy, there was approximately a 18% rise, and in Stamford, an 8% rise. Land use classification is a very poor predictor of material type in all three locations (lambda values below 0.0001).

#### Continuous variables

The analysis comparing building surface area as a continuous variable with building type, building material, land use and census tract for the three cities is presented in Table 2. Three measures of explaining power indicate the relative importance of the independent variables for predicting building surface area.

The one-way analysis of variance allows us to statistically test whether the means of subgroups into which our sample data are broken are significantly different from each other. We are testing the null hypothesis that the subgroup means are equal. If the means are not found to be significantly different, we cannot reject the null hypothesis, and we must assume that the deviations that occur are the result of sampling error. Conversely, if the means are significantly different, we cannot accept the the null hypothesis. The actual test compares the computed F ratio to the known sampling distribution of the F ratio, given the null hypothesis.

The first measure in Table 2, the significance of F, displays the probability value for an F test. Significance values listed correspond to the probability of obtaining an F value of that size or larger, given the null

Table 2. The continuous form of building surface area (dependent variable) on the independent variables of building type, building material, land use and census tract for Revere, Quincy and Stamford.

		Independent variables				
		Building type	Building material	Land use	Census tract	
<u>Dependent Variable</u>	Building surface area	Significance of F	< 0.0001	< 0.0001	0.6813	0.2088
			< 0.0001	< 0.0001	0.0251	0.0251
			0.0039	< 0.0001	0.0012	0.4307
	R <sup>2</sup>		0.2808	0.0949	0.0005	0.0005
			0.0860	0.0445	0.0575	0.0298
			0.0353	0.0385	-	0.0001
	n <sup>2</sup>		0.5127	0.1354	0.0019	0.0026
			0.0991	0.0860	0.0721	0.0318
			0.0462	0.1180	0.0296	0.0077

hypothesis of equality of means (Walpole and Myers 1978). By separating building surface area by building type (single-family residences, multi-family residences and commercial/industrial buildings), it is evident that the building type classification is an important grouping variate (probability values of 0.0039 in Stamford and <0.0001 in Revere and Quincy). Building material is also an important classification variable in all three locations. In Revere, grouping by land use explains little about building surface area, perhaps because of the large proportion of the Revere structures that are located in nonforested wetlands (59%). Census tract categorization is only marginally useful in Revere and Stamford. In Quincy, however, the F significance (0.0251) suggests census tract information to be more useful in categorizing building surface area.

The multiple correlation coefficient (Pearson R<sup>2</sup>) measures the proportion of variance of the dependent variable (building surface area) explained by the independent variables (building type, building material, land-use or census tract) when a standard linear regression model is applied to the data. The Pearson R<sup>2</sup> is a measure of the goodness of fit of the regression line to the data. The eta-squared ( $\eta^2$ ) statistic measures the same proportion but includes higher-order nonlinear terms (about the population means). These measures show that building type explains 28% of the linear variability of building surface area and 51% of the linear plus nonlinear variability in Revere. The building type classification explains minor pro-

portions in both Quincy and Stamford. Building material and land use explain only a small amount of the variability in building surface area. In addition, knowledge of census tract information appears to be of little help in predicting the building surface area.

#### SUMMARY AND CONCLUSIONS

Data bases on structures in Revere and Quincy, Massachusetts, and Stamford, Connecticut, were studied to determine if a measure of building material distribution could be calculated for a city using land use, census tract and building type information. Significance measures of chi-square, asymmetric lambda, uncertainty coefficient, F ordinate, as well as the  $R^2$  and  $\eta^2$  statistics were calculated for the three data bases. The Corps definition of building type was found to be the best (largest  $R^2$  and  $\eta^2$ ) predictor of the building surface area. However, all indicators (including building type) explained only low percentages of the variability in the dependent variable.

The chi-square statistic showed that a systematic relationship existed between building surface area and building type, building material, census tract and land use. A systematic relationship also existed between building material type and building type, census tract and land use.

The asymmetric lambda statistic indicated that the variables were fairly poor predictors of building surface area and building material type. The most consistent variable was building type at a value of 0.19 for predicting the building surface area. Building type was also the best predictor of building materials for Quincy and Stamford, but this relationship did not hold for Revere. Knowledge of land use did not improve predictions of building material type.

The uncertainty coefficient showed that knowledge of the independent variables did not reduce the uncertainty about the two dependent variables of building surface area or building material. The highest value was 0.50 for building type for Quincy, but the values for the other two data sets were low.

The F statistic is used to statistically test whether the means of subsamples in which the data are broken significantly differ from each other. The F values were large for the building type and building material variables, so we rejected the null hypothesis that the means are equal. However, for the land use and census tract variables in Revere the F-values were low,

so we cannot reject the null hypothesis that the means are equal; however, this did not hold for the Quincy and Stamford data sets for land use. As a result the variables of land use and census tract may not be useful for estimating the building surface area.

The  $R^2$  statistic measures the proportion of variance in the dependent variable, building surface area, that is linearly explained by the independent variables of building type, building material, land use or census tract. In all cases the  $R^2$  value is low, so the proportion of variance in the building surface area cannot be linearly explained by any of the independent variables. The largest  $R^2$  was for building type, but this was still too low to be of any value.

The  $\eta^2$  statistic measures the total (linear and nonlinear) variance that is explained by the independent variables of building type, building material, land use and census tract. In all cases the  $\eta^2$  statistic was low, with the highest value for building type for the Revere data set. This tentatively confirms that the Corps definition of building type is the best independent variable to use for predicting building surface area.

In summary, this study examined the use of three readily available classification variables (census tract, land use and building type) for predicting the exposed surface area of various building materials. Our results indicated that other variables are required to adequately explain the variability of building surface area.

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APPENDIX A: Cross tabulations of building surface area by building type, land use, census tract and building material, and material type by building type, land use and census tract.

Table A1. Cross tabulation of building surface area by building type for Revere.

Surface area (sq ft)	COUNT			TYPE			ROW TOTAL
	RCW	FCT	I	1	2	3	
	COL	PCT	I	1.00	2.00	3.00	
	TCT	PCT	I	1.00	2.00	3.00	
P < 1250				253	0	0	253
				100.0	0.0	0.0	20.2
				28.9	0.0	0.0	
1250 ≤ P < 1950				20.2	0.0	0.0	
				242	30	0	272
				85.0	11.0	0.0	21.7
1950 ≤ P < 2250				27.7	10.3	0.0	
				19.3	2.4	0.0	
				159	71	0	230
2250 ≤ P < 2750				69.1	30.9	0.0	18.4
				18.2	24.5	0.0	
				12.7	5.7	0.0	
2750 ≤ P				130	120	0	250
				52.0	48.0	0.0	20.0
				14.9	41.4	0.0	
C COLUMN TOTAL				10.4	9.6	0.0	
				90	69	89	248
				36.3	27.8	35.9	19.8
				10.3	23.8	100.0	
				7.2	5.5	7.1	
				874	290	89	1253
				69.8	23.1	7.1	100.0

Chi square = 610.18396 with 8 degrees of freedom; Significance = 0.0000

Lambda (asymmetric) = 0.00000 with TYPE dependent

Uncertainty coefficient (asymmetric) = 0.30190 with TYPE dependent

Pearson's R = 0.54634; Significance = 0.00000

Building type (TYPE) key: 1 = Single-family residential  
2 = Multi-family residential  
3 = Industrial/commercial

Table A2. Cross tabulation of building surface area by land use for Revere.

Surface area (sq ft)		COUNT		ROW		TOTAL	
		RCW	PCT	RCW	PCT	RCW	PCT
		11.00	12.00	17.00	51.00	62.00	
P < 1250		18	29	0	54	152	253
		7.1	11.5	0.0	21.3	60.1	21.2
		10.7	36.7	0.0	26.0	20.6	
		1.5	2.4	0.0	4.5	12.7	
1250 ≤ P < 1950		41	17	0	40	174	272
		15.1	6.3	0.0	14.7	64.0	22.8
		24.4	21.5	0.0	19.2	23.6	
		3.4	1.4	0.0	3.4	14.6	
1950 ≤ P < 2250		23	11	1	36	159	230
		10.0	4.8	0.4	15.7	69.1	19.3
		13.7	13.9	0.0	17.3	21.6	
		1.9	0.9	0.1	3.0	13.3	
2250 ≤ P < 2750		49	15	0	33	153	250
		19.6	6.0	0.0	13.2	61.2	21.0
		29.2	19.0	0.0	15.9	20.8	
		4.1	1.3	0.0	2.8	12.8	
2750 ≤ P		37	7	0	45	99	188
		19.7	3.7	0.0	23.9	52.7	15.8
		22.0	8.9	0.0	21.6	13.4	
		3.1	0.6	0.0	3.8	8.3	
COLUMN TOTAL		168	79	1	208	737	1193
		14.1	6.6	0.1	17.4	61.8	100.0

**Chi square = 53.93908 with 16 degrees of freedom; Significance = 0.0000**

**Lambda (asymmetric) = 0.00000 with LU dependent**

**Uncertainty coefficient (asymmetric) = 0.02086 with LU dependent**

**Pearson's R = -0.05059; Significance = 0.0403**

Land use (LU) key: 11 = Residential  
12 = Commercial and services  
17 = Other urban or built-up land  
51 = Streams and canals  
62 = Non-forested wetlands



Table A3. Cross tabulation of building surface area of census tract for Revere.

Surface area (sq ft)	COUNT			CENS			ROW TOTAL			
	RCW	PCT	I							
	CCL	PCT	I							
	TCT	PCT	I	1704.00	I	1705.00	I	1706.00	I	
P < 1250				21		191		41		253
				6.3		75.5		16.2		21.2
				12.7		22.1		25.0		
				1.8		16.0		3.4		
1250 ≤ P < 1950				47		185		40		272
				17.3		68.0		14.7		22.8
				28.3		21.4		24.4		
				3.9		15.5		3.4		
1950 ≤ P < 2250				44		158		28		230
				19.1		68.7		12.2		19.3
				26.5		18.3		17.1		
				3.7		13.2		2.3		
2250 ≤ P < 2750				39		172		39		250
				15.6		68.8		15.6		21.0
				23.5		19.9		23.8		
				3.3		14.4		3.3		
2750 ≤ P				15		157		16		188
				8.0		83.5		8.5		15.8
				5.0		18.2		9.8		
				1.3		13.2		1.3		
C COLUMN TOTAL				166		863		164		1193
				13.9		72.3		13.7		100.0

Chi square = 28.94434 with 8 degrees of freedom; Significance = 0.0003

Lambda (asymmetric) = 0.00000 with CENS dependent

Uncertainty coefficient (asymmetric) = 0.01638 with CENS dependent

CENS = Census tract

Table A4. Cross tabulation of building surface area by building material for Revere.

Surface area (sq ft)	COUNT		PCT		MAT						ROW TOTAL
	RCW	CCL	TCT	PCT	1.00	2.00	3.00	4.00	5.00	7.00	
P < 1250	248	98.4	22.3	20.9	3	1.2	0.4	0.0	0.0	0.0	252
											21.2
1250 ≤ P < 1950	259	96.6	23.3	21.8	9	3.4	0.0	0.0	0.0	0.0	268
											22.5
1950 ≤ P < 2250	223	97.8	20.0	18.8	4	1.8	0.0	0.4	0.0	0.0	228
											19.2
2250 ≤ P < 2750	240	97.2	21.6	20.2	6	2.4	0.4	0.0	0.0	0.0	247
											20.8
2750 ≤ P	143	73.7	12.8	12.0	28	14.4	8.2	4	2	1	194
											16.3
COLUMN TOTAL	1113	93.6	50	4.2	18	1.5	0.4	0.2	0.1	1189	100.0

Chi square = 169.86224 with 20 degrees of freedom; Significance = 0.0000

Lambda (asymmetric) = 0.00000 with MAT dependent

Uncertainty coefficient (asymmetric) = 0.17901 with MAT dependent

Pearson's R = 0.24372; Significance = 0.0000

Building material (MAT) key: 1 = wood 4 = cement/concrete  
2 = brick 5 = metal  
3 = stucco 7 = stone

Table A5. Cross tabulation of material by building type for Revere.

Material	COUNT			TYPE			ROW TOTAL
	ROW	PCT		1.00	2.00	3.00	
	CCL	FCT					
	TCT	FCT					
1 = Wood	821	275	17	1113			
	73.8	24.7	1.5	93.6			
	94.9	95.2	48.6				
	69.0	23.1	1.4				
2 = Brick	35	9	6	50			
	70.0	18.0	12.0	4.2			
	4.0	3.1	17.1				
	2.9	0.3	0.5				
3 = Stucco	7	4	7	18			
	38.9	22.2	38.9	1.5			
	0.8	1.4	20.0				
	0.6	0.3	0.6				
4 = Cement/concrete	2	1	2	5			
	40.0	20.0	40.0	0.4			
	0.2	0.3	5.7				
	0.2	0.1	0.2				
5 = Metal	0	0	2	2			
	0.0	0.0	100.0	0.2			
	0.0	0.0	5.7				
	0.0	0.0	0.2				
7 = Stone	0	0	1	1			
	0.0	0.0	100.0	0.1			
	0.0	0.0	2.9				
	0.0	0.0	0.1				
COLUMN TOTAL	865	289	35	1189			
	72.8	24.3	2.9	100.0			

Chi square = 227.50693 with 10 degrees of freedom; Significance = 0.0000

Lambda (asymmetric) = 0.00926 with TYPE dependent

Uncertainty coefficient (asymmetric) = 0.04562 with TYPE dependent

Pearson's R = 0.24365; Significance = 0.0000

Building type (TYPE) key: 1 = Single-family residential  
 2 = Multi-family residential  
 3 = Industrial/commercial

Table A6. Cross tabulation of material by land use for Revere.

Material

	COUNT		RCW		CCL		TCT		PCT		PCT		RCW		TCTAL	
	LU		PCT		PCT		PCT		PCT		PCT		PCT		PCT	
	11.00		12.00		17.00		51.00		62.00							
	PCT		PCT		PCT		PCT		PCT							
1 = Wood	144	79	1	176	694	1094	13.2	7.2	0.1	16.1	63.4	94.1	90.0	100.0	88.9	95.9
	12.4	6.8	0.1	15.1	59.7											
2 = Brick	13	0	0	14	20	47	27.7	0.0	0.0	29.8	42.6	4.0	8.1	0.0	7.1	2.8
	1.1	0.0	0.0	1.2	1.7											
3 = Stucco	3	0	0	6	6	15	20.0	0.0	0.0	40.6	40.6	1.3	1.9	0.0	0.0	0.8
	0.3	0.0	0.0	0.5	0.5											
4 = Cement/concrete	0	0	0	2	1	3	0.0	0.0	0.0	66.7	33.3	0.3	0.0	0.0	0.1	0.1
	0.0	0.0	0.0	0.2	0.1											
5 = Metal	0	0	0	0	2	2	0.0	0.0	0.0	0.0	100.0	0.2	0.0	0.0	0.3	0.3
	0.0	0.0	0.0	0.0	0.2											
7 = Stone	0	0	0	0	1	1	0.0	0.0	0.0	0.0	100.0	0.1	0.0	0.0	0.1	0.1
	0.0	0.0	0.0	0.0	0.1											
COLUMN TOTAL	160	79	0.1	198	724	1162	13.8	6.8	0.1	17.0	62.3	100.0				

Chi square = 33.10567 with 20 degrees of freedom; Significance = 0.0329

Lambda (asymmetric) = 0.00228 with LU dependent

Uncertainty coefficient (asymmetric) = 0.01388 with LU dependent

Pearson's R = -0.00925; Significance = 0.3764

Land use (LU) key: 11 = Residential  
 12 = Commercial and services  
 17 = Other urban or built-up land  
 51 = Streams and canals  
 62 = Non-forested wetlands

Table A7. Cross tabulation of material by census tract for Revere.

Material	COUNT			CENS			ROW TOTAL	
	RCW	FCT	I	RCW	FCT	I		
	CCL	FCT	I	CCL	FCT	I		
	TCT	FCT	I	1704.00	I	1705.00	1706.00	
1 = Wood				163		767	164	1094
				14.9		70.1	15.0	94.1
				95.8		92.1	100.0	
				14.0		66.0	14.1	
2 = Brick				2		45	0	47
				4.3		95.7	0.0	4.0
				1.2		5.4	0.0	
				0.2		3.9	0.0	
3 = Stucco				0		15	0	15
				0.00		100.0	0.0	1.3
				0.00		1.8	0.0	
				0.00		1.3	0.0	
4 = Cement/concrete				0		3	0	3
				0.00		100.0	0.0	0.3
				0.00		0.4	0.0	
				0.00		0.3	0.0	
5 = Metal				0		2	0	2
				0.00		100.0	0.0	0.2
				0.00		0.2	0.0	
				0.00		0.2	0.0	
7 = Stone				0		1	0	1
				0.00		100.0	0.0	0.1
				0.00		0.1	0.0	
				0.00		0.1	0.0	
COLUMN TOTAL				165		833	164	1162
				14.2		71.7	14.1	100.0

Chi square = 23.34875 with 10 degrees of freedom; Significance = 0.0095

Lambda (asymmetric) = 0.00000 with CENS dependent

Uncertainty coefficient (asymmetric) = 0.01985 with CENS dependent

Table A8. Cross tabulation of building surface area by building type for Quincy.

Surface area (sq ft)	COUNT			TYPE			ROW TOTAL
	RCW	FCTI	TCT	1.00I	2.00I	3.00I	
	CCL	FCTI	PCTI				
P < 1330	53	2	6	61			
	86.9	3.3	9.8	20.5			
	28.0	4.9	9.0				
	17.9	0.7	2.0				
1330 ≤ P < 1700	52	1	4	57			
	91.2	1.8	7.0	19.2			
	27.5	2.4	6.0				
	17.5	0.3	1.3				
1700 ≤ P < 2400	48	10	4	62			
	77.4	16.1	6.5	20.9			
	25.4	24.4	6.0				
	16.2	3.4	1.3				
2400 ≤ P < 60000	11	14	32	57			
	19.3	24.6	56.1	19.2			
	5.8	34.1	47.8				
	3.7	4.7	10.8				
60000 ≤ P	25	14	21	60			
	41.7	23.3	35.0	20.2			
	13.2	34.1	31.3				
	8.4	4.7	7.1				
COLUMN TOTAL	189	41	67	297			
	63.6	13.8	22.6	100.0			

Chi square = 106.08981 with 8 degrees of freedom; Significance = 0.0000

Lambda (asymmetric) = 0.19444 with TYPE dependent

Uncertainty coefficient (asymmetric) = 0.21288 with TYPE dependent

Pearson's R = 0.43941; Significance = 0.0000

Building type (TYPE) key: 1 = Single-family residential  
2 = Multi-family residential  
3 = Industrial/commercial

Table A9. Cross tabulation of building surface area by land use for Quincy.

Surface area (sq ft)	COUNT			LU			ROW TOTAL
	RCW	PCT	I	11.00	12.00	13.00	
	CCL	PCT	I				
	TCT	PCT	I				
P < 1330	59			96.7	3.3	0.0	61
	26.3			26.0	0.7	0.0	20.7
1330 ≤ P < 1700	55			96.5	3.5	0.0	57
	24.6			18.6	0.7	0.0	19.3
1700 ≤ P < 2400	55			88.7	11.3	0.0	62
	24.6			18.6	2.4	0.0	21.0
2400 ≤ P < 60000	26			46.4	48.2	5.4	56
	11.6			8.8	9.2	1.0	19.0
60000 ≤ P	29			49.2	49.2	1.7	59
	12.9			9.8	9.8	0.3	20.0
COLUMN TOTAL	224			75.9	22.7	1.4	295

Chi square = 86.22865 with 8 degrees of freedom; Significance = 0.0000

Lambda (asymmetric) = 0.01408 with LU dependent

Uncertainty coefficient (asymmetric) = 0.25348 with LU dependent

Pearson's R = 0.46365; Significance = 0.0000

Land use (LU) key: 11 = Residential  
12 = Commercial and services  
13 = Industrial

Table A10. Cross tabulation of building surface area by census tract for Quincy.

Surface area  
(sq ft)

	COUNT	CENS				RCW
	RCW FCT	4177.00	4179.00	4180.00	4191.00	TOTAL
	CCL PCT					
	TCT PCT					
P < 1330		2 3.3 1.8 0.7	0 0.0 0.0 0.0	19 31.7 18.4 6.5	39 65.0 29.1 13.4	60 20.5
1330 ≤ P < 1700		1 1.8 1.9 0.3	0 0.0 0.0 0.0	3 5.4 2.9 1.0	52 92.9 38.8 17.8	56 19.2
1700 ≤ P < 2400		7 11.3 13.5 2.4	0 0.0 0.0 0.0	21 33.9 20.4 7.2	34 54.8 25.4 11.6	62 21.2
2400 ≤ P < 60000		19 34.5 36.5 6.5	3 5.5 100.0 1.0	31 56.4 30.1 10.6	2 3.6 1.5 0.7	55 18.8
60000 ≤ P		23 39.0 44.2 7.9	0 0.0 0.0 0.0	29 49.2 28.2 9.9	7 11.9 5.2 2.4	59 20.2
COLUMN TOTAL		52 17.8	3 1.0	103 35.3	134 45.9	292 100.0

Chi square = 146.72485 with 12 degrees of freedom; Significance = 0.0000

Lambda (asymmetric) = 0.32278 with CENS dependent

Uncertainty coefficient (asymmetric) = 0.26690 with CENS dependent

Pearson's R = -0.59848; Significance = 0.0000

CENS = Census tract



Table All. Cross tabulation of building surface area by material type for Quincy.

Surface area (sq ft)	COUNT		RCW		PCT		CCL		PCT		TCT		PCT		RCW		TCTAL	
	MAT		I		I		I		I		I		I		I		I	
	I		I		I		I		I		I		I		I		I	
	I		I		I		I		I		I		I		I		I	
	1.00		2.00		4.00		5.00		6.00		7.00							
P < 1330	56		3		2		0		0		0						61	
	91.8		4.9		11.1		0.0		0.0		0.0						20.5	
	24.6		6.3		11.1		0.0		0.0		0.0							
	18.9		1.0		0.7		0.0		0.0		0.0							
1330 ≤ P < 1700	52		2		3		0		0		0						57	
	91.2		3.5		5.3		0.0		0.0		0.0						19.2	
	22.8		4.5		16.7		0.0		0.0		0.0							
	17.5		0.7		1.0		0.0		0.0		0.0							
1700 ≤ P < 2400	57		3		1		1		0		0						62	
	91.9		4.8		1.6		1.6		0.0		0.0						20.9	
	25.0		6.8		5.6		25.0		0.0		0.0							
	19.2		1.0		0.3		0.3		0.0		0.0							
2400 ≤ P < 60000	22		24		7		1		2		1						57	
	38.6		42.1		12.3		1.8		3.5		1.8						19.2	
	5.6		54.5		38.9		25.0		100.0		100.0							
	7.4		8.1		2.4		0.3		0.7		0.3							
60000 ≤ P	41		12		5		2		0		0						60	
	68.3		20.0		8.3		3.3		0.0		0.0						20.2	
	18.0		27.3		27.8		50.0		0.0		0.0							
	13.8		4.0		1.7		0.7		0.0		0.0							
COLUMN TOTAL	228		44		18		1.4		0.2		0.1						297	
	76.8		14.8		6.1		1.3		0.7		0.3						100.0	

Chi square = 82.53572 with 20 degrees of freedom; Significance = 0.0000

Lambda (asymmetric) = 0.02899 with MAT dependent

Uncertainty coefficient (asymmetric) = 0.17244 with MAT dependent

Pearson's R = 0.25271; Significance = 0.0000

Building material (MAT) key: 1 = Wood 5 = Metal  
 2 = Brick 6 = Shingles  
 3 = Stucco 7 = Stone  
 4 = Cement/concrete

Table A12. Cross tabulation of material by building type for Quincy.

Material	COUNT			TYPE			ROW TOTAL
	RCW	FCT	ICT	1.0C	2.0C	3.0C	
	PCT	PCT	PCT				
	TCT	TCT	TCT				
1 = Wood	187	33	8	228			
	82.0	14.5	3.5	76.8			
	95.9	20.5	11.9				
	63.0	11.1	2.7				
2 = Brick	0	6	38	44			
	0.0	13.6	86.4	14.8			
	0.0	14.6	56.7				
	0.0	2.0	12.8				
4 = Cement/concrete	0	1	17	18			
	0.0	5.6	94.4	6.1			
	0.0	2.4	25.4				
	0.0	0.3	5.7				
5 = Metal	0	1	3	4			
	0.0	25.0	75.0	1.3			
	0.0	2.4	4.5				
	0.0	0.3	1.0				
6 = Shingles	2	0	0	2			
	100.0	0.0	0.0	0.7			
	1.1	0.0	0.0				
	0.7	0.0	0.0				
7 = Stone	0	0	1	1			
	0.0	0.0	100.0	0.3			
	0.0	0.0	1.5				
	0.0	0.0	0.3				
COLUMN TOTAL	189	41	67	297			
	63.6	13.8	22.6	100.0			

Chi square = 222.19681 with 10 degrees of freedom; Significance = 0.0000

Lambda (asymmetric) = 0.54630 with TYPE dependent

Uncertainty coefficient (asymmetric) = 0.43205 with TYPE dependent

Pearson's R = 0.60608; Significance = 0.0000

Building type (TYPE) key: 1 = Single-family residential  
2 = Multi-family residential  
3 = Industrial/commercial

Table A13. Cross tabulation of material by land use for Quincy.

Material	COUNT			LU			ROW TOTAL
	RCW	FCT	I	11.00	12.00	13.00	
	CCL	FCT	I				
	TCT	FCT	I				
1 = Wood				197	30	1	228
				86.4	13.2	0.4	77.3
				87.9	44.8	25.0	
				66.8	10.2	0.3	
2 = Brick				14	28	1	43
				32.6	65.1	2.3	14.6
				6.3	41.8	25.0	
				4.7	9.5	0.3	
4 = Cement/concrete				7	9	1	17
				41.2	52.9	5.9	5.8
				3.1	13.4	25.0	
				2.4	3.1	0.3	
5 = Metal				4	0	0	4
				100.0	0.0	0.0	1.4
				1.8	0.0	0.0	
				1.4	0.0	0.0	
6 = Shingles				1	0	1	2
				50.0	0.0	50.0	0.7
				0.4	0.0	25.0	
				0.3	0.0	0.3	
7 = Stone				1	0	0	1
				100.0	0.0	0.0	0.3
				0.4	0.0	0.0	
				0.3	0.0	0.0	
COLUMN TOTAL				224	67	1.4	295
				75.9	22.7	1.4	100.0

Chi square = 108.09769 with 10 degrees of freedom; Significance = 0.0000

Lambda (asymmetric) = 0.22535 with LU dependent

Uncertainty coefficient (asymmetric) = 0.19916 with LU dependent

Pearson's R = 0.29973; Significance = 0.0000

Land use (LU) key: 11 = Residential  
12 = Commercial and services  
13 = Industrial

Table A14. Cross tabulation of material by census tract for Quincy.

Material	CENS				RCW TOTAL
	COUNT				
	RCW	PCT			
	CCL	PCT			
	TCT	PCT			
	-----	-----	-----	-----	
		4177.00	4179.00	4180.00	4191.00
1 = Wood		26	0	69	133
		11.4	0.0	30.3	58.3
		50.0	0.0	67.0	99.3
		8.9	0.0	23.6	45.5
2 = Brick		23	3	13	1
		57.5	7.5	32.5	2.5
		44.2	100.0	12.6	0.7
		7.9	1.0	4.5	0.3
4 = Cement/concrete		3	0	14	0
		17.6	0.0	82.4	0.0
		5.8	0.0	13.6	0.0
		1.0	0.0	4.8	0.0
5 = Metal		0	0	4	0
		0.0	0.0	100.0	0.0
		0.0	0.0	3.9	0.0
		0.0	0.0	1.4	0.0
6 = Shingles		0	0	2	0
		0.0	0.0	100.0	0.0
		0.0	0.0	1.9	0.0
		0.0	0.0	0.7	0.0
7 = Stone		0	0	1	0
		0.0	0.0	100.0	0.0
		0.0	0.0	1.0	0.0
		0.0	0.0	0.3	0.0
COLUMN TOTAL	-----	-----	-----	-----	-----
		52	3	103	134
		17.8	1.0	35.3	45.9

Chi square = 116.60788 with 15 degrees of freedom; Significance = 0.0000

Lambda (asymmetric) = 0.27215 with CENS dependent

Uncertainty coefficient (asymmetric) = 0.18350 with CENS dependent

Pearson's R = -0.46424; Significance = 0.0000

CENS = Census tract

Table A15. Cross tabulation of building surface area by building type for Stamford.

Surface area  
(sq ft)

	COUNT			TYPE			
	RCW	PCT	I				RCW
	CCL	PCT	I				TOTAL
	TCT	PCT	I				
				1.00	2.00	3.00	
P < 1600							
			10		18	14	42
	23.8						17.7
	45.5				12.2	20.9	
	4.2				7.6	5.9	
1600 ≤ P < 1900							
			2		15	2	19
	10.5				78.9	10.5	8.0
	9.1				10.1	3.0	
	0.8				6.3	0.8	
1900 ≤ P < 2200							
			0		34	1	35
	0.0				97.1	2.9	14.8
	0.0				23.0	1.5	
	0.0				14.3	0.4	
2200 ≤ P < 4575							
			2		55	13	70
	2.9				78.6	18.6	29.5
	9.1				37.2	19.4	
	0.8				23.2	5.5	
4575 ≤ P							
			8		26	37	71
	11.3				36.6	52.1	30.0
	36.4				17.6	55.2	
	3.4				11.0	15.6	
COLUMN TOTAL							
			22		148	67	237
			9.3		62.4	28.3	100.0

Chi square = 63.99710 with 8 degrees of freedom; Significance = 0.0000

Lambda (asymmetric) = 0.12360 with TYPE dependent

Uncertainty coefficient (asymmetric) = 0.16740 with TYPE dependent

Pearson's R = 0.20281; Significance = 0.0008

Building type (TYPE) key: 1 = Single-family residential  
2 = Multi-family residential  
3 = Industrial/commercial

Table A16. Cross tabulation of building surface area by land use for Stamford.

Surface area (sq ft)	COUNT	RCW	FCTI	PCTI	LU	RCW	TCTAL
	CCL	FCTI	PCTI				
	TCT	PCTI					
				11.00	I	12.00	I
					I		I
P < 1600				66	I	1	I
				98.5	I	1.5	I
				21.2	I	2.6	I
				18.9	I	0.3	I
					I		I
1600 ≤ P < 1900				36	I	3	I
				92.3	I	7.7	I
				11.6	I	7.7	I
				10.3	I	0.9	I
					I		I
1900 ≤ P < 2200				99	I	8	I
				92.5	I	7.5	I
				31.8	I	20.5	I
				28.3	I	2.3	I
					I		I
2200 ≤ P < 4575				64	I	10	I
				86.5	I	13.5	I
				20.6	I	25.6	I
				18.3	I	2.9	I
					I		I
4575 ≤ P				46	I	17	I
				73.0	I	27.0	I
				14.8	I	43.6	I
				13.1	I	4.9	I
					I		I
COLUMN				311		39	
TOTAL				88.9		11.1	
							350
							100.0

Chi square = 24.61073 with 4 degrees of freedom; Significance = 0.0001

Lambda (asymmetric) = 0.00000 with LU dependent

Uncertainty coefficient (asymmetric) = 0.09865 with LU dependent

Pearson's R = 0.24341; Significance = 0.0000

Land use (LU) key: 11 = Residential  
12 = Commercial and services

Table A17. Cross tabulation of building surface area by census tract for Stamford.

Surface area (sq ft)	CENS				RCW TOTAL	
	COUNT					
	RCW PCT					
	CCL PCT					
	TCT PCT	201.00	213.00	215.00	216.00	
P < 1600		11	38	3	17	69
		15.9	55.1	4.3	24.6	19.1
		15.1	26.2	14.3	13.8	
		3.0	10.5	0.8	4.7	
1600 ≤ P < 1900		1	27	1	10	39
		2.6	69.2	2.6	25.6	10.8
		1.4	18.6	4.8	8.1	
		0.3	7.5	0.3	2.8	
1900 ≤ P < 2200		14	58	4	31	107
		13.1	54.2	3.7	29.0	29.6
		19.2	40.0	19.0	25.2	
		3.9	16.0	1.1	8.6	
2200 ≤ P < 4575		17	7	9	43	76
		22.4	9.2	11.8	56.6	21.0
		23.3	4.8	42.9	35.0	
		4.7	1.9	2.5	11.9	
4575 ≤ P		30	15	4	22	71
		42.3	21.1	5.6	31.0	19.6
		41.1	10.3	19.0	17.9	
		8.3	4.1	1.1	6.1	
COLUMN TOTAL		73	145	21	123	362
		20.2	40.1	5.8	34.0	100.0

Chi square = 90.04289 with 12 degrees of freedom; Significance = 0.0000

Lambda (asymmetric) = 0.23502 with CENS dependent

Uncertainty coefficient (asymmetric) = 0.10705 with CENS dependent

Pearson's R = -0.16360; Significance = 0.0009

CENS = Census tract

**Table A18. Cross tabulation of building surface area by material type for Stamford.**

Surface area (sq ft)		MAT						
COUNT	I							
RCW	FCTI							RCW
CCL	PCTI							TOTAL
TCT	PCT	1.00	2.00	3.00	4.00	5.00	7.00	
P < 1600		52	5	1	10	0	2	70
		74.3	7.1	1.4	14.3	0.0	2.9	19.2
		18.9	12.5	16.7	27.0	0.0	50.0	
		14.3	1.4	0.3	2.7	0.0	0.5	
1600 ≤ P < 1900		37	0	0	2	0	0	39
		94.9	0.0	0.0	5.1	0.0	0.0	10.7
		13.5	0.0	0.0	5.4	0.0	0.0	
		10.2	0.0	0.0	0.5	0.0	0.0	
1900 ≤ P < 2200		105	1	1	0	0	0	107
		98.1	0.9	0.9	0.0	0.0	0.0	29.4
		38.2	2.5	16.7	0.0	0.0	0.0	
		28.8	0.3	0.3	0.0	0.0	0.0	
2200 ≤ P < 4575		58	10	4	4	0	0	76
		76.3	13.2	5.3	5.3	0.0	0.0	20.9
		21.1	25.0	66.7	10.2	0.0	0.0	
		15.9	2.7	1.1	1.1	0.0	0.0	
4575 ≤ P		23	24	0	21	2	2	72
		31.9	33.3	0.0	29.2	2.8	2.8	19.8
		8.4	60.0	0.0	56.8	10.0	50.0	
		6.3	6.6	0.0	5.8	0.5	0.5	
COLUMN TOTAL		275	40	6	37	2	4	364
		75.5	11.0	1.6	10.2	0.5	1.1	100.0

Chi square = 138.36243 with 20 degrees of freedom; Significance = 0.0000

**Lambda (asymmetric) = 0.01124 with MAT dependent**

Uncertainty coefficient (asymmetric) = 0.23783 with MAT dependent

**Pearson's R = 0.20937; Significance = 0.0000**

**Building material (MAT) key:** 1 = Wood      4 = Cement/concrete  
2 = Brick      5 = Metal  
3 = Stucco      7 = Stone



Table A19. Cross tabulation of material by building type for Stamford.

Material	COUNT			TYPE			ROW TOTAL
	RCW	FCTI					
	CCL	PCTI					
	TCT	PCTI					
			1.00	2.00	3.00		
1 = Wood	13	20	125	5		150	
	90.9	84.5	7.6			63.6	
	8.5	53.0	2.1				
2 = Brick	2	15	22			38	
	2.6	39.5	57.9			16.1	
	4.5	10.1	33.3				
	0.4	6.4	9.3				
3 = Stucco	1	5	0			6	
	16.7	33.3	0.0			2.5	
	4.5	3.4	0.0				
	0.4	2.1	0.0				
4 = Cement/concrete	0	1	35			36	
	0.0	2.8	97.2			15.3	
	0.0	0.7	53.0				
	0.0	0.4	14.8				
5 = Metal	0	0	2			2	
	0.0	0.0	100.0			0.8	
	0.0	0.0	0.8				
7 = Stone	0	2	2			4	
	0.0	50.0	50.0			1.7	
	0.0	1.4	3.0				
	0.0	0.8	0.8				
COLUMN TOTAL	22	148	66			236	
	9.3	62.7	28.0			100.0	

Chi square = 157.04660 with 10 degrees of freedom; Significance = 0.0000

Lambda (asymmetric) = 0.48864 with TYPE dependent

Uncertainty coefficient (asymmetric) = 0.41690 with TYPE dependent

Pearson's R = 0.60098; Significance = 0.0000

Building type (TYPE) key: 1 = Single-family residential  
2 = Multi-family residential  
3 = Industrial/commercial

Table A20. Cross tabulation of material by land use for Stamford.

Material	COUNT		LU		ROW
	RCW	PCTI			TOTAL
	CCL	PCTI			
	TCT	PCTI	11.00	12.00	
1 = Wood					
			260	15	275
			94.5	5.5	78.8
			83.6	39.5	
			74.5	4.3	
2 = Brick					
			28	5	33
			84.8	15.2	9.5
			9.0	13.2	
			8.0	1.4	
3 = Stucco					
			1	5	6
			16.7	83.3	1.7
			0.3	13.2	
			0.3	1.4	
4 = Cement/concrete					
			19	10	29
			65.5	34.5	8.3
			6.1	26.3	
			5.4	2.9	
5 = Metal					
			1	1	2
			50.0	50.0	0.6
			0.3	2.6	
			0.3	0.3	
7 = Stone					
			2	2	4
			50.0	50.0	1.1
			0.6	5.3	
			0.6	0.6	
COLUMN			311	38	349
TOTAL			89.1	10.9	100.0

Chi square = 67.53949 with 5 degrees of freedom; Significance = 0.0000

Lambda (asymmetric) = 0.10526 with LU dependent

Uncertainty coefficient (asymmetric) = 0.18584 with LU dependent

Pearson's R = 0.36309; Significance = 0.0000

Land use (LU) key: 11 = Residential  
12 = Commercial and services

Table A21. Cross tabulation of material by census tract for Stamford.

Material	COUNT	CENS				RCW
	RCW PCT					TOTAL
	CCL PCT					
	TCT PCT	201.00	213.00	215.00	216.00	
1 = Wood		20	131	13	111	275
		7.3	47.8	4.7	40.4	76.2
		27.8	90.3	61.9	90.2	
		5.5	36.3	3.6	30.7	
2 = Brick		20	9	2	9	40
		50.00	22.5	5.0	22.5	11.1
		27.8	5.2	9.5	7.4	
		5.5	2.5	0.6	2.5	
3 = Stucco		5	1	0	0	6
		8.3	16.7	0.0	0.0	1.7
		6.9	0.7	0.0	0.0	
		1.4	0.3	0.0	0.0	
4 = Cement/concrete		22	4	6	2	34
		64.7	11.8	17.6	5.9	9.4
		30.6	2.8	28.6	1.6	
		6.1	1.1	1.7	0.6	
5 = Metal		1	0	0	1	2
		50.0	0.0	0.0	50.0	0.6
		1.4	0.0	0.0	0.0	
		0.3	0.0	0.0	0.0	
7 = Stone		4	0	0	0	4
		100.0	0.0	0.0	0.0	1.1
		5.6	0.0	0.0	0.0	
		1.1	0.0	0.0	0.0	
C COLUMN		72	145	21	123	361
TCTAL		19.9	40.2	5.8	34.1	100.0

Chi square = 142.98911 with 15 degrees of freedom; Significance = 0.0000

Lambda (asymmetric) = 0.17593 with CENS dependent

Uncertainty coefficient (asymmetric) = 0.14882 with CENS dependent

Pearson's R = -0.52048; Significance = 0.0000

**END**

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